# Some experience with biomarker driven cancer clinical trials

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# Outline

- Statistical Considerations (prior talks)
  - Impact of treatment and biomarker(s) on patient outcome (predictive and prognostic associations)
  - •Impact of design choices on inference
- Experience
  - •S9704 Prognostic Targeting
  - •S1406 Single mutation (or subgroup) targeting
  - •S1400 Multiple sub-group targeting

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# Traditional divisions of treatments by types of cancer

- Sites: Breast, Lung, Gastrointestinal, Genitourinary, Melanoma, Leukemia, Lymphoma, Myeloma, Sarcoma
- Traditional trials in sub-sites, histologies, early stage, advanced stages relapsed disease
- But increasingly disease is characterized molecularly into much finer divisions





#### Variation in efficacy

- Genetic or protein measurement (designing statistical interactions)
  - HER2 amplification [Herceptin]
  - EGFR mutation [Erlotinib]
  - tyrosine kinase enzyme (c-kit) [Imatinib]
  - BRAF mutation [Vemurafenib]
- Multi-variable genetics predicting treatment efficacy
  - OncotypeDx recurrence score (breast cancer)
  - Other Tumor genomics



### Stages of treatment testing(learning)

#### Phase I

- The safe dose range, side effects, early activity.
- Phase II
- Sufficient promise for further testing, more side effect assessment, refinement of dose, evidence of disease subtypes with most promise and feasibility.
  - Some design examples: single arm 2-stage, single arm pilot, multi-arm randomized (screening or selection).
  - Phase III

• Formal comparison of new treatment to "standard".



## Outcome Associations in Trials: Choosing Target Design

- Biomarker Treatment Interaction Model Two cases:
  - 1) Treatment is essentially equally effective regardless of gene
  - 2) The expression indicates where one treatment is preferred



### General Case: Discrete Subgroup Models

For designing treatment trials, summaries based on a subgroup of patients are often useful.

At least 3 components are of interest:

1. Rules to describe a subgroup of patients, R.

2.A model for treatment effect in that group

3. The mass (or the fraction of all patients in that group)

Eligibility  $\longrightarrow$   $(R, M(R), \nu(R)) \leftarrow$  Fraction of patients

•The triple describes future design properties

Main effect

•Example of subaroup models

$$M(R) = \theta(Z|X \in R) = \alpha(R) + \beta(R)Z$$

Treatment effect



 $R = \{X \ge c\}$ 

 $M(R) = \theta(Z|X \in R)$ 

# Model Class 1: Targeted Design



Standard Treatment (A)

Advantages: If treatment is only effective in a subgroup this is powerful. However, if there is broader activity or if the goal is to assess a marker, then this is not a good design.





Options: Stratification overall test, subgroup+overall testing, interactior tests

Measure prospectively or retrospectively



Standard Treatment (A)

This is not a good design if one believes treatment can only be efficacious for  $(R_{+})$  group.



# SWOG: a diverse network and part of US NCTN

- Network of 650+ sites, including:
  - 40 core member institutions
  - ~14 strongly associated Lead Academic Participating Sites
  - 28 NCI-designated cancer centers
  - 27 Community Clinical Oncology Programs
  - 27 SPORES
  - Extensive collaboration within Canada
  - Sites in Europe, Middle East, Latin America, Asia
- Membership includes:
  - More than 5,000 researchers & clinicians
  - Almost 5,000 research nurses & clinical research associates



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# The Past: A design based on a prognostic model: SWOG 9704



#### S9432 Phase II pilot study: High Dose Therapy with Transplant for Newly Diagnosed KI67 Positive Diffuse Aggressive Lymphoma

- Based on KI67 proliferation model from prior samples
- Identified a very poor risk group
- KI67>80% cell staining
  - 3 year OS of 18% versus 56%. This population is appropriate for high dose chemotherapy and transplant [optimistic difference]
  - 18% of patients with diffuse aggressive lymphoma have a KI67 > 80% [small subgroup size]
- Frozen tissue/paraffin was sent to University of Arizona
- "Real" time communication back to institution to determine treatment assignment
- Study closed due to poor accrual (3 patients)



# Alternative prognostic model and supportive data

- International prognostic index (IPI) for lymphoma developed from a large data base
- Combination of multiple easily measured clinical variables; no need for tissue
- IPI=Stage II vs. III/IV, low vs. high LDH, performance status 0-1 vs. ≥ 2, > 1 extra nodal site
  - High-Int risk  $\geq$  3 factors, High Risk  $\geq$  4 factors
- Retrospective analysis of a French Phase III study supporting high dose therapy in poor prognostic group, the high-intermediate risk which was approximately 30% of the patients



S9704: A Randomized Phase III Trial Comparing Early High Dose Therapy and Autologous Stem Cell Transplant to Conventional Dose CHOP/R Chemotherapy for Patients with Diffuse Aggressive Non-Hodgkin's Lymphoma in High-Intermediate and High Risk Groups



# S9704 Timeline

- S9704 Activated 9/15/97
- Results from a large randomized study CHOP vs. CHOP-Rituximab showing improved survival for CHOP-R.
- Rituximab was added for all B-cell CD20+ lymphomas on 4/1/03
- Chose not to redesign the trial to target only B-cell CD20+ patients
- Trial closed 12/17/07 after reaching its randomization accrual goal



#### S9704 Results: Grade III–IV Toxicities

Toxicities	CHOP (R) x 1 + ASCT	CHOP (R) x 3	
	(%)	(%)	
Infection	50	13	
GI	26	5	
Metabolic	13	1	
Lung	11	2	
CV	10	4	
Neurologic	7	2	
Hypoxia	4	0	
Hepatic	3	0	
Treatment deaths	6	2	

N=253 randomized patients



## Outcome of randomized patients

- Targeting the poor prognostic subgroup identified a group that benefited for PFS but not OS
- Some suggestion of greater effect in the highest risk group (interaction p-value . 02).



# S9704 Highest Risk IPI Subgroup

- While only exploratory there was suggestion of an effect in the highest risk group
- Was the poor prognostic group targeting not sufficiently aggressive?



# **Diffuse Large Cell Lymphoma:** Gene Expression on archived tissue specimens (same disease as S9704)

- Gene expression arrays (quantitative, large numbers)
  - Fresh or frozen tissue (problematic for multi-institutional studies, also often a problem wrt to use of historical samples)
- Gene expression from paraffin (array plate technology) <100 genes
  - Great for our multi-institutional cooperative group studies
- Data from several clinical trials.
  - Both before and after the introduction of Rituxan therapy to standard chemotherapy
- Analysis focused on overall prognostic effect, no evidence of interactions



#### Hazard rates for multiple genes for DLBCL



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Rimsza et al. 20**SWOG** 

## **Practical Issues**

- The biomarker wasn't workable yet in S9432.
- The fraction of high risk patients (targeted group was less than expected.
- There were questions of when to hold the design fixed and when to be more flexible. It was a practical choice for S9704 not to redesign mid-trial after the introduction of Rituximab for the B-Cell subgroup.
- Given the limited sample sizes available, we need to consider modeling based on data from multiple sources to guide targeting.



## **Recent Past and Present**

- Recently multiple examples of genomic or other biomarker targeted studies
- Antje Hoering presented SWOG studies
  Lung Cancer Study S0819
  - Breast Cancer Study S1007
- Many more but with some general themes
  - Typically a single target group
  - Many issues with respect defining target



#### S1406 Randomized Phase II study of Irinotecan and Cetuximab with or without Vemurafenib in BRAF Mutant Metastatic Colorectal Cancer



Irinotecan and Cetuximab

Example of targeting (on mutation at time): If treatment is only effective in a subgroup this is powerful

Special: Embedded Patient-Derived Xenograft Co-Clinical Trial



## A New Present: Lung-Map S1400

• Special thanks to Mary Redman (slides and more)





Also in Canada in Q1 or Q2 of 2015 (hopefully) !

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### Unmet needs addressed by a Master Protocol



- How to develop drugs for uncommon-rare genotypes?
- How to apply broad-based screening (NGS)?
- How to achieve acceptable turnaround times for molecular testing for therapy initiation? (<2 weeks)</li>
- How to expedite the new drugbiomarker FDA approval process? (companion diagnostic)



### Master Protocol Design



Sub-studies assigned based on biomarker results, patients with multiple biomarkers randomly assigned to sub udy.

xp = Targeted therapy (TT) or TT combinations (TTC), Exp<sup>1-4</sup> are different TT/TTC regimens

MT = non-match study experimental therapy or combinations

oC = docetaxel or erlotinib,  $SoC^{1-5}$  depends on biomarker and TT/TTC/NMT regimen



## Study Design and Objectives

#### **Design:**

Independently conducted and analyzed parallel Phase II/III studies

#### Primary Objectives within each sub-study:

#### Phase II Component:

1.To evaluate if there is sufficient evidence to continue to the Phase III component by comparing progression-free survival (PFS) between patients randomized to experimental therapy versus SoC.

#### Phase III Component:

1.To determine if there is both a statistically and clinically-meaningful difference in PFS between the treatment arms.

2.To compare overall survival (OS) between treatment arms.



# Goals

#### Improve screening

- Screening large numbers of patients for multiple targets
- Reduce screen failure rate
- Provide a sufficient "hit rate" to engage patients & physicians
- Increase speed of drug evaluation and development:
  - Provide an infrastructure to open new sub-studies faster
  - Rapid drug/biomarker testing for detection of "large effects"
  - Facilitate FDA approval of new drugs and bring safe & effective drugs to patients faster



## Lung-MAP current sub-studies





#### Patient-Sample Schema





### Study Design Within Each Sub-study





### Statistical Design: Phase II Interim Analysis

	Phase II Design						
	Plan A	Plan B					
Primary Outcome	PFS						
Sample Size	55 progression events						
Target HR (% improvement)	HR = 0.5 2-fold increase	HR=0.4 2.5-fold increase					
Power	90%	95%					
Type I error	10%	4%					
Approx. Threshold to continue:							
HR % improvement	HR= 0.71 41% increase	HR = 0.61 63% increase					

Each sub-study can choose between Plan A or Plan B to determine "bar" for continuation past Phase 2 interim analysis

#### Statistical Design: Phase III

	PFS and OS Co-primary			
	PFS	OS		
Events	290	256		
Null Hypothesis (HR)	0.75 <sup>*</sup> (33% improvement)	1.0 (equivalence)		
Alternative Hypothesis	0.5 (2-fold increase)	0.67 (50% improvement)		
Type I error (1-sided)	0.014 against HR = 1.33 < 0.00001 against HR = 1	0.025		
Power	90%	90%		

\* Non HR = 1 null hypothesis encodes clinical significance

Sample size based on OS for all studies

#### Sample Size for the Sub-studies

			Phase 2		Phase 3	
ıb-study ID		Prevalence Estimate <sup>1</sup>	Approximate Sample Size	Approximate time of analysis	Sample Size	Approximate time of analysis
400A(non-mate	ch)²	56%	170	8	400	21
400B(PI3K) <sup>3</sup>						
	GNE+	6%	78		288	
	FMI+	8%	152	19	400	72
400C(CDK4/6)		12%	124	11	312	45
400D (FGFR)		9%	112	11	302	53
400E (HGF)		16%	144	9	326	37

Prevalence estimates: 35% with 1; 8% with 2; 0.8% with 3; 0% with 4 biomarkers S1400A design and minimum PD-L1+: 50 (phase 2), 114 (phase 3) patients S1400B design: eligibility based on FMI criteria, but designed around subgroup defined to be GNE+ (assumed ~70% of FMI+)

独LUNG-MAP

# Study development time-line



# **Design Issues**

- Master study but how much variation by sub-study for design specifications?
- Different target efficacy by sub-study
- Additional assay(s) added to FMI assay
- Frequency of marker subgroups what sub-study frequency remains feasible?

Sub-study Eligibility  $\longrightarrow (R, M(R), \nu(R)) \longleftarrow$  Fraction of patients in sub-study

Treatment effect



# Complex study lessons learned

- Communicate early and often with partners
  - OPEN(registration) saw Lung-MAP as one study, but we were planning to activate it as six.
  - Better specifications for how the marker data would be received. Plan for change (Central IRB, new assays)
  - Improved communication with pharmaceutical partners and institutions regarding SWOG structure, attributes and processes

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### Learning more from Master protocols

- Impact of dynamic multiple sub-study design and inference (as genotype groups open and close patient population changes)
- Opportunities for modeling of treatment effects are possible based on detailed genomic data and additional use of specimens

 $(R, M(R), \nu(R))$ 

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